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## Wheat basal crop coefficients determined by normalized difference vegetation index

Received: 6 January 2004 / Accepted: 3 May 2005 / Published online: 21 July 2005  
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**Abstract** Crop coefficient methodologies are widely used to estimate actual crop evapotranspiration ( $ET_c$ ) for determining irrigation scheduling. Generalized crop coefficient curves presented in the literature are limited to providing estimates of  $ET_c$  for “optimum” crop condition within a field, which often need to be modified for local conditions and cultural practices, as well as adjusted for the variations from normal crop and weather conditions that might occur during a given growing season. Consequently, the uncertainties associated with generalized crop coefficients can result in  $ET_c$  estimates that are significantly different from actual  $ET_c$ , which could ultimately contribute to poor irrigation water management. Some important crop properties such as percent cover and leaf area index have been modeled with various vegetation indices (VIs), providing a means to quantify real-time crop variations from remotely-sensed VI observations. Limited research has also shown that VIs can be used to estimate the basal crop coefficient ( $K_{cb}$ ) for several crops, including corn and cotton. The objective of this research was to develop a model for estimating  $K_{cb}$  values from observations of the normalized difference vegetation index (NDVI) for spring wheat. The  $K_{cb}$  data were derived from back-calculations of the FAO-56 dual crop coefficient procedures using field data obtained during two wheat experiments conducted during 1993–1994 and 1995–1996 in Maricopa, Arizona. The performance of the  $K_{cb}$  model for estimating  $ET_c$  was evaluated using data from a third wheat experiment in 1996–1997, also in Maricopa, Arizona. The  $K_{cb}$  was modeled as a function of a normalized quantity for NDVI, using a third-order polynomial regression relationship ( $r^2=0.90$ ,  $n=232$ ). The estimated

seasonal  $ET_c$  for the 1996–1997 season agreed to within  $-33$  mm ( $-5\%$ ) to  $18$  mm ( $3\%$ ) of measured  $ET_c$ . However, the mean absolute percent difference between the estimated and measured daily  $ET_c$  varied from  $9\%$  to  $10\%$ , which was similar to the  $10\%$  variation for  $K_{cb}$  that was unexplained by NDVI. The preliminary evaluation suggests that remotely-sensed NDVI observations could provide real-time  $K_{cb}$  estimates for determining the actual wheat  $ET_c$  during the growing season.

### Introduction

An important requirement for attaining proper irrigation scheduling is the determination of actual crop evapotranspiration ( $ET_c$ ) during the growing season. The crop coefficient ( $K_c$ ) methodology (Doorenbos and Pruitt 1977) was developed to provide growers with a simple  $ET_c$  prediction tool for guiding irrigation management decisions. This widely applied approach to  $ET_c$  estimation is governed by empirically developed  $K_c$  ratios of measured  $ET_c$  and a reference evapotranspiration, traditionally based on either grass or alfalfa evapotranspiration. For grass-reference evapotranspiration ( $ET_o$ ),  $K_c$  is defined as:

$$K_c = ET_c / ET_o \quad (1)$$

During the growth season, values of  $K_c$  for most agricultural crops increase from a minimum value at planting in relation to changes in canopy development until a maximum  $K_c$  is reached at about full canopy cover. At some point in the season after full cover is reached, the  $K_c$  will tend to decline, the extent of which is primarily dependent on the particular growth characteristics of the crop (Jensen et al. 1990) and the irrigation management during the late season (Allen et al. 1998). A crop coefficient curve is the seasonal distribution of  $K_c$ , often expressed as a smooth continuous function in time or some other time-related index.

Communicated by E. Christen

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The Food and Agricultural Organization (FAO) of the UN, Paper 56 [FAO-56] (Allen et al. 1998) presented revised crop coefficient procedures for estimating  $ET_c$ , which are expected to become the de facto crop coefficient standard for the USA and abroad. In addition to the single  $K_c$  approach, FAO-56 introduced dual crop coefficient procedures where the single  $K_c$  is separated into a basal crop coefficient, or  $K_{cb}$  (primary crop transpiration), and a soil evaporation coefficient ( $K_e$ ), where

$$K_c = (K_{cb} + K_e) \quad (2)$$

The dual crop coefficient method with  $K_{cb}$  and  $K_e$  allows computation of more precise estimates of daily  $ET_c$ , particularly for days following irrigation or rain, when increased soil evaporation can cause actual  $K_c$  values to deviate significantly from a single, time-averaged  $K_c$  curve. The FAO-56 publication provides typical development lengths for growth stages and tabularized  $K_{cb}$  values for most agricultural crops. However, since the development lengths and  $K_{cb}$  values provided in FAO-56 are intended to strictly represent conditions for standard crop densities and optimum agronomic and water management practices, the publication strongly encourages local calibration of development lengths and, if warranted from research findings, recommends modifying  $K_{cb}$  curves to more adequately reflect the crop water use behavior under the local conditions (Allen et al. 1998). Thus, using time-based  $K_{cb}$  curves can become problematic in that one needs to estimate crop development rate and maximum  $K_{cb}$  early in the season to accommodate atypical crop development and water use patterns that may arise later in the season due to weather anomalies, non-standard plant stands, or sub-optimum nutrient or water inputs.

Multispectral vegetation indices (VIs), computed from crop canopy reflectance measurements, were demonstrated to function effectively as near real-time surrogates of  $K_{cb}$  for corn (Bausch and Neale 1987,

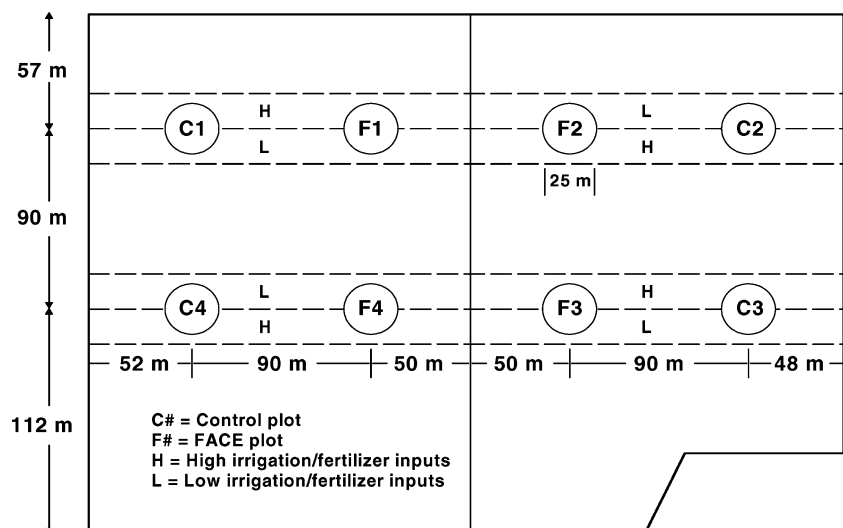
1989; Bausch 1995), beans (Jayanthi et al. 2001), and cotton (Neale et al. 1996). A few of the benefits for the VI-based crop coefficients reported in these studies include the ability to account for variations in plant growth due to abnormal weather conditions, and improved irrigation scheduling due to better estimation of water use and more appropriate timing of irrigations. Multispectral VIs, computed as differences, ratios, or linear combinations of reflected light in the visible (blue, green, and red) and near infrared (NIR) have been found to be closely related to crop growth parameters, such as leaf area index (Moran et al. 1995) and vegetation cover (Heilman et al. 1982; Jackson and Huete 1992). The normalized difference vegetation index, or NDVI [ $NDVI = (NIR - red)/(NIR + red)$ ] and the soil adjusted vegetation index (SAVI; Huete 1988) are the two predominant VIs that are used for estimating crop coefficients.

In the arid, desert regions of the southwestern US, high water use requirements coupled with increasing costs for water in the region require wheat growers to implement irrigation practices that will lead to increased water use efficiency. One of the most important elements in the area will be a greater emphasis on appropriate irrigation management. The focus of this paper is to provide a means for improving wheat irrigation scheduling and management in the area using real-time crop coefficient estimation. The objectives were to develop a model for determining wheat  $K_{cb}$  directly from NDVI observations; and to provide an evaluation of wheat evapotranspiration calculated using NDVI-based  $K_{cb}$  estimates within FAO-56 procedures.

## Methods and materials

A series of four, free-air  $CO_2$  enrichment (FACE) experiments were conducted with a hard red spring wheat (*Triticum aestivum* L., cv. Yecora Rojo) between

**Fig. 1** Field plot plan for the 1993–1994 to 1996–1997 FACE experiments showing four replicate circular FACE plots and four corresponding control plots. All circular main plots were split into semicircular sub-plots of either high and low irrigation inputs (1993–1994) or high and low nitrogen fertilizer inputs (1995–1996 and 1996–1997)



1991 and 1997 in central Arizona, at the University of Arizona, Maricopa Agricultural Center (MAC), Maricopa, Arizona (Kimball et al. 1999). Data acquired during three of the seasons (1993–1994, 1995–1996, and 1996–1997) were used to develop and test an NDVI-based  $K_{cb}$  model for wheat (data for the first FACE wheat experiment, 1992–1993, were not included due to limited NDVI measurements). During the FACE wheat studies, data were collected for a wide range of plant, soil, and meteorological parameters. Additional information about the experimental procedures, descriptions on the methodology of data collection, and crop evapotranspiration can be found in Wall and Kimball (1993), Kimball et al. (1995, 1999), Hunsaker et al. (1996, 2000), and Pinter et al. (1996, 2000).

The FACE experiments investigated the interactive effects of elevated  $CO_2$  and irrigation water supply (1993–1994) and elevated  $CO_2$  and nitrogen level (1995–1996 and 1996–1997) on wheat. The experimental design for these experiments included eight, circular main plots, 25 m in diameter, placed within a 9-ha wheat field (Fig. 1). In four FACE treatment plot replicates, the air above the wheat canopy was enriched with  $CO_2$  at a concentration of  $\approx 550 \mu\text{mol mol}^{-1}$ . In the other four plots that comprised the control treatment, wheat was grown under ambient air conditions, where daytime ambient  $CO_2$  concentrations within the plots averaged  $\approx 360 \mu\text{mol mol}^{-1}$  during the three wheat seasons. Although the control and FACE replicates were separated center to center by 90 m (Fig. 1), Kimball et al. (1999) estimated that the  $CO_2$  concentration within control plots averaged  $15 \mu\text{mol mol}^{-1}$  or about 4% higher than that of the actual ambient air at MAC, indicating that control plots were slightly contaminated by FACE plots. Additional sub-treatments with high and low water supply (1993–1994) and high and low nitrogen level (1995–1996 and 1996–1997) were embedded within the eight main treatment plots. However, for this paper, only data for the four replicated sub-treatment control plots within each experiment (denoted as C–H plots) that were grown under ambient  $CO_2$  and with high inputs for irrigation and nitrogen were considered. Note that ambient  $CO_2$  concentrations are expected to continue increasing and it is likely that within the near future the atmospheric  $CO_2$  will be  $15 \mu\text{mol mol}^{-1}$  or more higher than it was at the time of the FACE experiments in the mid-1990s. Although a significant change in the wheat  $ET_c$  of C–H plots due to the 4% increase in  $CO_2$  would be highly unlikely, the slightly higher than ambient  $CO_2$  concentrations in the C–H plots would tend to increase the applicability of this wheat data set for use in a future higher- $CO_2$  world.

### Crop culture

The spring wheat was planted on flat ground in mid-December in east-west rows, spaced 0.25-m apart. Crop emergence was observed on 28 December 1993, 1 Jan-

uary 1996, and 3 January 1997, and the plant density at complete emergence varied from 186 to 194 plants  $\text{m}^{-2}$  for the three seasons (Kimball et al. 1999). A combination of chemical and biological methods were used to control insects and weeds. The C–H plots received a total of  $261 \text{ kg N ha}^{-1}$  during 1993–1994, and  $350 \text{ kg N ha}^{-1}$  during both 1995–1996 and 1996–1997. Final harvests of grain occurred on 1 June 1994, 29 May 1996, and 28 May 1997, and mean grain yields for the C–H treatment were  $7,436 \pm 872$ ,  $7,400 \pm 662$ , and  $5,977 \pm 81 \text{ kg ha}^{-1}$ , respectively.

### Soil characteristics

The soil at the FACE experimental site is classified as a Trix clay loam [fine-loamy, mixed (calcareous), hyperthermic Typic Torrifluvents] (Kimball et al. 1999). Volumetric soil water contents at 100% and 0% total available water (TAW) averaged 30 and 20% for the top 0.7 m of the soil profile, respectively, whereas they averaged only 22 and 12%, for the subsurface profile (0.7–2.0 m), respectively (Hunsaker et al. 1994).

### Irrigation management

Five and nine days after planting the 1993–1994 experiment, 13 and 17 mm of water was applied, respectively, to all plots with a portable sprinkler systems for seed germination (Hunsaker et al. 1996). Six and 13 days after planting the 1995–1996 and 1996–1997 experiments, respectively, 30 mm of water was applied to all plots for germination (Hunsaker et al. 2000). Afterwards, for all experiments, irrigation water was supplied with a subsurface drip irrigation system that included micro-tube lines spaced every 0.50-m apart, buried 0.18–0.25 m below the soil surface, parallel to the wheat rows. For all wheat seasons, the C–H plots were irrigated at approximately 30% depletion of the available soil water with an amount calculated to replace 100% of the estimated wheat  $ET_c$  since the last irrigation (adjusted for rainfall), as determined by the irrigation scheduling program, AZSCHED (Fox et al. 1992). The AZSCHED program uses a single  $K_c$  approach and an  $ET_o$  calculation based on equations presented in FAO-24 (Doorenbos and Pruitt 1977) and therefore differs considerably from the methods used in the FAO-56 dual crop coefficient procedures. The relatively small allowable depletion percentage of 30% used within AZSCHED resulted in frequent, light irrigations to C–H plots. This approach was intended to minimize water stress conditions on the wheat that may occur by any under prediction of  $ET_c$  based on the single  $K_c$  used in AZSCHED. Cumulative amounts of the metered irrigation applications from planting through harvest for the C–H plots averaged 650, 653, and 621 mm for the 1993–1994, 1995–1996, and 1996–1997 seasons, respectively, and the cumulative rainfall (planting through

harvest) measured at the field site was 61, 39, and 35 mm, respectively (Hunsaker et al. 1996, 2000).

#### Soil water content measurements

Volumetric soil water contents were measured in each plot using time-domain-reflectometry (TDR) and neutron scattering equipment installed at the beginning of each experiment (Hunsaker et al. 1996; Hunsaker et al. 2000). The TDR system (Trase1, Soil-Moisture Equip. Corp., Santa Barbara, CA) was used to measure the integrated volumetric soil water content from 0 to 0.30 m below the soil surface. (Note: product names and company names are included for the benefit of the reader and do not imply endorsement of the product by the authors or the US Department of Agriculture). Neutron probe access tubes were installed to a depth of 2.0 m at a location near the TDR in each plot. Site-calibrated neutron probes (Model 503, Campbell Pacific Nuclear, Martinez, CA) were used to measure the volumetric water contents in 0.2-m increments from 0.40 to 2.0 m. For all experiments, the TDR and neutron probe measurements were made on the same days for all plots during early morning hours. The frequency of soil water content measurements varied from 3 to 11 days from crop emergence through early February for each year. After early February, the frequency of water content measurements varied from 2 to 8 days for each year until shortly before final harvest.

#### Crop canopy height, reflectance, and transmittance measurements

Wheat canopy height was determined from plants sampled from each plot at 7- to 10-day intervals throughout each season. Starting at crop emergence, canopy reflectance factors were measured in all plots two to five times per week during each of the three growing seasons (Pinter et al. 2000). Data were acquired in red (0.61–0.68  $\mu\text{m}$ ) and near-infrared (NIR, (0.79–0.89  $\mu\text{m}$ ) wavelengths using a 4-band Exotech hand-held radiometer (Model BX-100; Exotech, Inc., Gaithersburg, MD) equipped with 15° field-of-view optics. Data were collected at a morning-time period corresponding to a nominal solar zenith angle of 57°. The normalized difference vegetation index was computed as:  $\text{NDVI} = (\text{NIR} - \text{red}) / (\text{NIR} + \text{red})$ .

Every two to three weeks during the 1993–1994 and 1995–1996 seasons, and on days when canopy reflectance measurements were made, the fraction of the photosynthetically active radiation (PAR; 0.40–0.70  $\mu\text{m}$  absorbed by the canopy ( $f_{\text{A PAR}}$ ) was calculated from measurements of the incident, transmitted, and reflected components of the radiation balance using a 0.80-m long light bar (Model LI-191, Li-Cor, Inc., Lincoln, NE). The light bar measurements were made at a 45° diagonal with plant rows, both above and below the plant canopy

in all treatment plots. Similar measurements were made at a separate bare soil plot in the same field. To compute  $f_{\text{A PAR}}$ , the fraction of PAR transmitted through the canopy ( $f_{\text{T PAR}}$ ), the fraction of PAR reflected from the canopy, and the fraction of the PAR reflected from the soil, obtained from the light bar measurements, were used in the light balance equation described by Pinter et al. (1994).

#### Meteorological data and reference evapotranspiration ( $\text{ET}_0$ )

In FAO-56, Allen et al. (1998, pp65–86) describe methods for calculating grass-reference  $\text{ET}_0$ . The meteorological data used in the  $\text{ET}_0$  calculations for the study were provided by an AZMET weather station (Brown 1989) located on a well-watered grass site at MAC,  $\approx 1.5$  km from the FACE field. Both the station and field plots were surrounded by similarly cropped areas and the flat terrain at MAC did not present any obstacles that would deem the off-site weather station as being non-representative of evapotranspiration conditions at the field site. Daily AZMET data for solar radiation, air temperature, wind speed, and humidity were used to calculate daily  $\text{ET}_0$  for a short, 0.12-m height crop (similar to clipped grass) with the FAO Penman–Monteith equation (Allen et al. 1998, Eq. 6):

$$\text{ET}_0 = \frac{0.408\Delta(R_n - G) + \gamma 900/(T + 273)u_2(e_s - e_a)}{\Delta + \gamma(1 + 0.34u_2)} \quad (3)$$

where  $\text{ET}_0$  = reference evapotranspiration ( $\text{mm d}^{-1}$ ),  $R_n$  = net radiation ( $\text{MJ m}^{-2} \text{d}^{-1}$ ),  $G$  = soil heat flux density ( $\text{MJ m}^{-2} \text{d}^{-1}$ ),  $T$  = air temperature at 2-m height ( $^{\circ}\text{C}$ )  $\Delta$  = slope saturation vapor pressure curve ( $\text{kPa } ^{\circ}\text{C}^{-1}$ ),  $\gamma$  = psychrometric constant ( $\text{kPa } ^{\circ}\text{C}^{-1}$ ),  $e_s$  = saturation vapor pressure ( $\text{kPa}$ ),  $e_a$  = actual vapor pressure ( $\text{kPa}$ ), and  $u_2$  = wind speed at 2-m height ( $\text{m s}^{-1}$ ).

#### Evapotranspiration from soil water balance

The measured wheat  $\text{ET}_c$  that occurred between two successive soil water content measurement dates was calculated as the residual of the soil water balance equation (Jensen et al. 1990) and can be written as:

$$\text{ET}_c = (D_{r,2} - D_{r,1}) + I + R - \text{DP} \quad (4)$$

where  $\text{ET}_c$  is the total evapotranspiration (mm) between two successive soil water measurement dates,  $D_{r,1}$  and  $D_{r,2}$  are the measured root zone soil water depletion (mm) on first and second dates, respectively, and  $I$ ,  $R$ , and  $\text{DP}$  are the depth of irrigation applied (mm), and the rainfall (mm) and the deep percolation (mm) that occurred between the two soil water measurements, respectively. For Eq. 4, the maximum depth of the



effective wheat rooting depth ( $Z_r$ ) was assumed to be 1.3 m. The assumption was based on detailed soil water extraction work by Erie et al. (1982) in Arizona, showing that 99% of irrigated wheat water uptake occurs in the upper 1.2–1.4-m soil depth. The 1.3-m maximum rooting depth was also supported by soil water depletion patterns observed for C–H plots during the three seasons (data not shown). When irrigation or heavy rainfall was added between two successive soil water measurements, an estimate of deep percolation was made. The estimate for DP was calculated as the amount of increased soil water storage (if any) that occurred within soil layers measured below 1.3 m following the wetting event. This technique does not provide an effective way to evaluate any deep percolation water below a depth of 2.0 m, nor a means to estimate any DP water possibly returning to the root zone under capillary action. Consequently, when imprecise estimates of actual DP are used in the water balance, errors can be introduced in the estimate for  $ET_c$ . However, evaluating changes in soil moisture below the rooting depth offered the best way to detect and approximate actual DP with any of the measurements made during these studies. Potential errors for measured  $ET_c$  due to uncertainties for DP will be discussed later in results and discussion.

#### Basal crop coefficient derivations

Soil water balance determinations of the measured wheat  $ET_c$  for two- to eleven-day intervals during the three seasons were used to derive  $K_{cb}$  estimates for each of the four C–H plot replicates. Derivation was accomplished by back-calculating a  $K_{cb}$  value for each interval based on the “known” value for the total  $ET_c$  during the interval from the soil water balance, a methodology similar to that used by Hunsaker et al. (2003). The FAO-56 dual crop coefficient procedures (Allen et al. 1998, pp135–158) were employed in the back-calculations to separate the measured  $ET_c$  into the basal and evaporation contributions, while considering the effects of water stress on the basal  $ET_c$ . The FAO-56 dual crop coefficient procedures describe the relationship between  $ET_c$  and  $ET_o$  upon separating the single  $K_c$  into the basal crop and soil water evaporation coefficients:

$$K_c = (K_{cb} + K_e) = ET_c/ET_o \quad (5)$$

where  $ET_c$  and  $ET_o$  are in  $\text{mm d}^{-1}$ .

The basal crop coefficient,  $K_{cb}$ , represents the ratio of  $ET_c/ET_o$  for conditions when, first, the soil surface layer is dry (i.e., when  $K_e = 0$ ) and, second, the soil water within the root zone is adequate to sustain full plant transpiration (non-stressed conditions). When the soil surface is wetted following irrigation or rain, the FAO-56 dual crop coefficient procedures calculate the separate contribution to  $ET_c$ , apart from basal crop water use, due to soil evaporation described by the soil evaporation coefficient,  $K_e$  (Allen et al. 1998, pp142–158). The FAO-56 method uses a two-stage drying approach for deter-

mination of  $K_e$ . For stage 1 (energy limiting stage), evaporation from a wet soil surface proceeds at a maximum rate limited only by the energy available at the soil surface. Stage 1 ends when the cumulative evaporation from the soil surface exceeds readily evaporable water (REW), the maximum depth of cumulative evaporation without restriction during stage 1. For stage 2 (falling rate stage), evaporation from the soil surface decreases in proportion to the amount of water remaining in the surface layer until the cumulative evaporation reaches total evaporable water (TEW), the maximum depth of evaporation that can occur from the initially wetted surface layer during a complete drying cycle. REW is dependent upon the soil texture of the surface layer and normally varies between 8 mm and 12 mm for clay loam (Allen et al. 1998, Table 19). For the present analysis, a mid REW value of 10 mm for clay loam was assumed for all C–H replicates. TEW is dependent on the field capacity ( $\theta_{FC}$ ) and wilting point ( $\theta_{WP}$ ) volumetric soil water contents of the surface soil layer ( $Z_e$ ) subject to drying by evaporation, and varies from 22 mm to 29 mm for the soil type as given in Table 19 of FAO-56. TEW for all C–H replicates was based on the mean soil water content values of 30 and 20% at field capacity and wilting point determined for the upper soil profile at the site, respectively, combined with the mid-range depth for  $Z_e$  (0.125 m) in FAO-56, which resulted in a TEW of 25 mm, when calculated using equation 73 in FAO-56. Two other primary parameters required for determining  $K_e$  are (1) the daily fraction of the soil surface shaded by the canopy ( $f_c$ ), or conversely the unshaded fraction ( $1 - f_c$ ), and (2) the fraction of the soil surface wetted ( $f_w$ ) during each irrigation and precipitation event (Allen et al. 1998, pp147–149). Values for the unshaded fraction of the canopy,  $1 - f_c$ , were approximated from the fraction of the incident PAR transmitted through the canopy ( $fT_{PAR}$ ) determined with the light bar measurements made separately for each C–H replicate during the 1993–1994 and 1995–1996 wheat seasons. Daily values for  $fT_{PAR}$  ( $\approx 1 - f_c$ ) were then estimated by linear interpolation between days of light bar measurements. Because similar light bar measurements were not made in the 1996–1997 experiment, estimates of daily  $fT_{PAR}$  for replicates in that season were obtained from daily NDVI observations for the replicates using a calibration model developed from the 1995–1996  $fT_{PAR}$  and NDVI data (Hunsaker et al. 2000). For all years and replicates, a value of 1.0 was assigned for  $f_w$  when rain or sprinkler irrigation occurred (i.e., the entire soil surface was assumed to have been wetted). Following subsurface drip irrigation events, the value used for  $f_w$  was calculated using the FAO-56 recommendations for subsurface drip systems (Allen et al. 1998, pp147), where  $f_w = 0.30 (1 - 0.67 f_c)$ . Following wetting events, a daily water balance of the exposed and wetted fraction of the surface soil layer was applied to calculate cumulative evaporation from the wet condition (Allen et al. 1998, Eq. 77).

When the available soil water of the effective crop rooting depth drops below a critical level, crop water

stress can occur and reduce  $ET_c$ . The effects of water stress on  $ET_c$  (Allen et al. 1998, pp161–170) are estimated by multiplying  $K_{cb}$  by the water stress coefficient ( $K_s$ ) so that:

$$ET_c = (K_{cb}K_s + K_e)ET_o \quad (6)$$

where  $K_s < 1$  when the available soil water is insufficient for full  $ET_c$ , and  $K_s = 1$  when there is no soil water limitation on  $ET_c$ . Determination of  $K_s$  requires computation of the daily soil water balance of the effective root zone (separate from the surface soil evaporation layer daily water balance) to estimate the root zone soil water depletion ( $D_r$ ) for each day of the season. The value of  $K_s$  is dependent upon  $D_r$ , TAW for the effective crop rooting depth ( $Z_r$ ), and a soil depletion fraction,  $p$ , which is limited between 0.1 and 0.8. The  $p$  value represents the fraction of TAW that can be depleted from the rooting depth before water-stress occurs. For a given day  $i$ , the calculation of  $K_s$  is given as:

$$K_{s,i} = (TAW_i - D_{r,i}) / (TAW_i - pTAW_i) \quad (7)$$

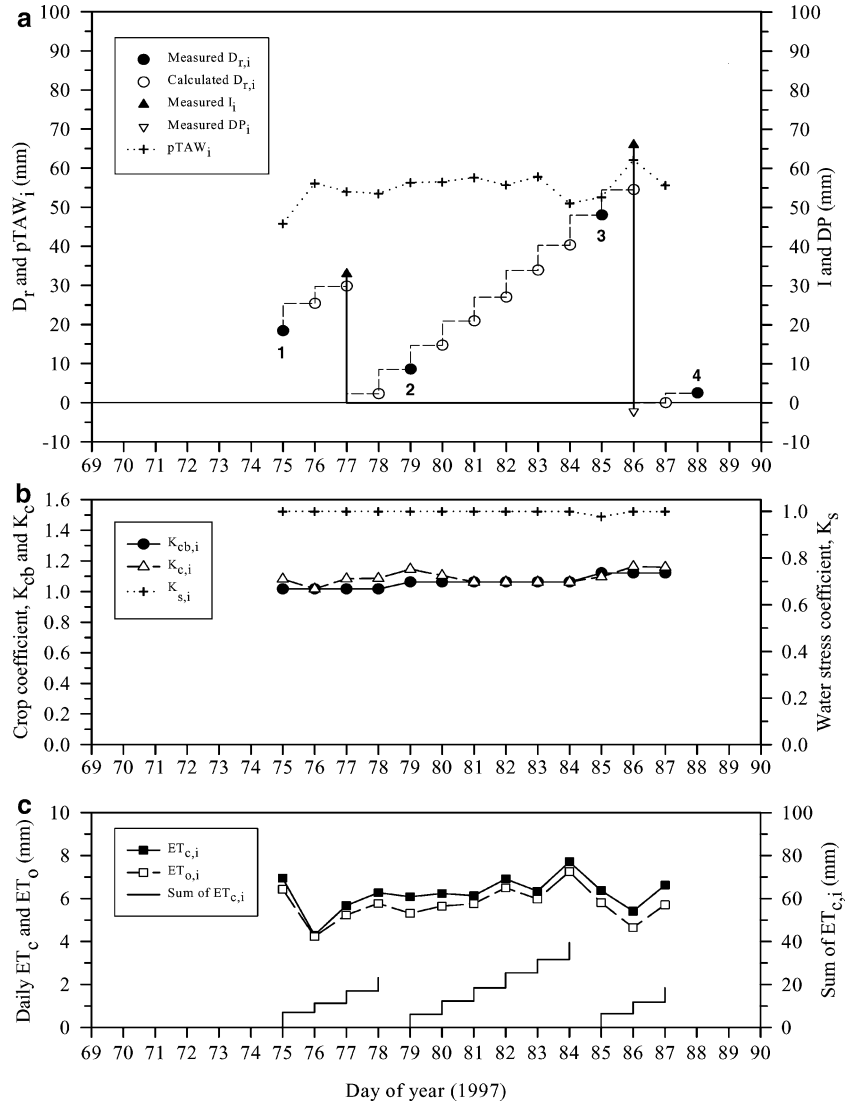
where  $K_{s,i} = 1$  when  $D_{r,i}$  is smaller than equal to  $pTAW_i$  and  $K_{s,i} < 1$  otherwise.  $TAW_i$  is calculated as:

$$TAW_i = 1000(\theta_{FC} - \theta_{WP})Z_{r,i} \quad (8)$$

where  $TAW_i$  is in units of mm,  $\theta_{FC}$  and  $\theta_{WP}$  are in  $m^3 m^{-3}$ , and  $Z_{r,i}$  is in m.

For the present analysis, the site determined mean values for  $\theta_{FC}$  and  $\theta_{WP}$  of 0.30 and 0.20  $m^3 m^{-3}$ , respectively, were used for soil layers from 0 to 0.7 m, whereas the site determined values of 0.22 and 0.12  $m^3 m^{-3}$ , respectively, were used for  $\theta_{FC}$  and  $\theta_{WP}$  for soil layers below 0.7 m, for all replicates and years. Thus, when the maximum  $Z_r$  of 1.3 m is attained, TAW is equal to 130 mm with Eq. 8. A typical implementation of the FAO-56 procedures is to assume that the daily increase for  $Z_r$  up to the maximum occurs proportionately to the increase in daily  $K_{cb}$  to its maximum. However, this approach was not used for

**Fig. 2** Back-calculation process illustrated for a C–H replicate during the 1996–1997 wheat season: **a** daily root zone water balance components for three measurement intervals from DOY 75 to DOY 87 showing measured and calculated daily root zone depletion ( $D_{r,i}$ ), measured irrigation ( $I_i$ ) and deep percolation ( $DP_i$ ), and the estimated daily upper limit for allowable soil water depletion ( $pTAW_i$ ); **b** derived daily basal crop coefficients ( $K_{cb,i}$ ), and estimated daily total crop coefficients ( $K_{c,i}$ ) and water stress coefficients ( $K_{s,i}$ ); **c** daily estimated crop evapotranspiration ( $ET_{c,i}$ ), daily calculated reference evapotranspiration ( $ET_{o,i}$ ), and daily summation of  $ET_{c,i}$  for each measurement interval



the  $K_{cb}$  back-calculation derivations since it requires the  $K_{cb}$  curve to be already established ahead of time. Consequently, for estimating daily TAW by Eq. 8, it was assumed that the daily  $Z_r$  for all replicates and years increased linearly from a minimum value of 0.25 m at crop emergence (Allen et al. 1998, pp279) to the maximum of 1.3 m in proportion to the increase in measured canopy height. The canopy height approximation for  $Z_r$  was found to agree reasonably well with monthly root biomass depth measured for replicates by Wechsung et al. during the three seasons (Wechsung et al. 1995, 1998). The tabulated depletion fraction ( $p$ ) of 0.55 for wheat (FAO-56, Table 22) was adjusted daily for atmospheric demand following the FAO-56 numerical approximation procedures, where daily  $p = 0.55 + 0.04 (5 - ET_c)$ .

Starting with the first soil water measurement after crop emergence, the wheat season was partitioned into a series of time intervals whose lengths (2–11 days) were established by the number of days between two successive soil water content measurements. The total measured  $ET_c$  for each interval was known from the soil water balance and the daily  $ET_o$  for each day in the interval was calculated by Eq. 3 using daily weather data. Thus, for a given interval, the daily values for  $K_{cb}$ ,  $K_e$ , and  $K_s$  were back-calculated as a consequence of the values for total measured  $ET_c$ , calculated daily  $ET_o$ , and the soil and crop parameter estimates used in FAO-56. This can be described for a given interval from day 1 to day  $n-1$  as:

$$\sum_{i=1}^{n-1} ET_{c,i} = \sum_{i=1}^{n-1} (K_{cb,i}K_{s,i} + K_{e,i})ET_{o,i} \quad (9)$$

where day 1 is the day a soil water content measurement was made in the morning, and day  $n$  is the next day a soil water content measurement was made in the morning; the summation of  $ET_{c,i}$  from day 1 to day  $n-1$  equals the measured total  $ET_c$  for the interval;  $K_{cb,i}$ ,  $K_{s,i}$ , and  $K_{e,i}$  are the basal crop, water stress, and soil evaporation coefficients on day  $i$ , respectively, and  $ET_{o,i}$  is the grass-reference evapotranspiration on day  $i$ . For each C–H plot, daily time-step calculations for  $K_{cb}$ ,  $K_e$ ,  $K_s$ ,  $ET_c$ ,  $ET_o$ , and the other required parameters of the FAO-56 dual crop coefficient procedures were made within a spreadsheet that contained all the computations for each day of the growing season. Derivation involved adjusting the  $K_{cb,i}$  value for the given measurement interval until the right-hand side of Eq. 9 matched the quantity on the left-hand side of the equation, i.e., until it agreed with the total  $ET_c$  that was measured for the interval. The  $K_{cb,i}$  were assumed to be constant for all days within the interval, i.e., each day within the interval had the same  $K_{cb}$  value.

The back-calculation process is illustrated for three sequential soil water measurement intervals beginning on day of year (DOY) 75 and ending on DOY 87 for one of the C–H replicates in 1997 (Fig. 2). The measured  $ET_c$  for the four-day interval from DOY 75 to 78

was 23 mm. Daily root zone water balance computations for the interval were initiated at the beginning of DOY 75, starting with the soil water depletion ( $D_r$ ) that was measured in the morning of that day (shown in Fig. 2a as the enclosed circle designated as 1). The open circles shown on days following the measured  $D_r$  at 1 represent the  $D_r$  at the beginning (morning) of each new day in the interval, as determined by the root zone water balance after input of the  $D_r$ , irrigation, rain,  $ET_c$ , and DP were made through the end of the previous day. Derivation of the constant  $K_{cb}$  value for the four-day interval ended when a given  $K_{cb}$  (Fig. 2b) resulted in the summation of the daily  $ET_c$  for the interval being equal to the measured  $ET_c$ , or 23 mm (Fig. 2c). The daily values of  $pTAW$  (Fig. 2a) represent the upper limit for soil water depletion, above which crop water stress occurs causing  $K_s$  (Fig. 2b) to decrease below a value of 1.0. The effect of water stress on the derivation is illustrated for the three-day interval starting on DOY 85 and ending on DOY 87, where  $D_r$  at the end of DOY 85 (above the enclosed circle designated as 3 in Fig. 2a) was greater than  $pTAW$  for that day. The constant  $K_{cb}$  derived for the interval was 1.12, but because  $K_s$  was less than 1.0 on DOY 85, the  $K_c$  on DOY 85 was slightly less (1.10) than the  $K_{cb}$  (Fig. 2b). When water stress did not occur (i.e.,  $K_s = 1$ ), the difference between the  $K_c$  and  $K_{cb}$  values on a given day is the magnitude for  $K_e$  and, thus, the difference represents the relative proportion of the daily  $ET_c$  due to soil evaporation. The soil evaporation for all days in Fig. 2 was small and represented about 3% of the  $ET_c$ . However,  $K_e$  did increase slightly above basal  $K_{cb}$  following both of the irrigations (Fig. 2a, b). During this same three-day interval (DOY 85 to 87), the irrigation applied on DOY 86 exceeded  $D_r$  at the end of DOY 86 indicating that some DP occurred. The DP quantified from soil water measurements was 2.2 mm, represented by the downward open triangle on DOY 86 (Fig. 2a).

#### Paired NDVI observations with derived $K_{cb}$

Data for the derived  $K_{cb}$  and measured NDVI for the first two seasons (1993–1994 and 1995–1996) were used to develop a relationship for describing the wheat  $K_{cb}$  values as a function of NDVI. The measured NDVI values were first interpolated linearly, generating separate daily NDVI values for each of the four replicates for both years. The daily NDVI data were then normalized to account for differences in the measured NDVI values at crop emergence that occurred between the two years. The average NDVI value measured at crop emergence for the four replicates in each season was used as the lower limit (minimum NDVI). A maximum NDVI for each season was calculated as the average of the highest three measured NDVI values for each replicate, averaged over the four replicates. Daily NDVI values were normalized as:

$$\text{NDVI}_n = [\text{NDVI} - \text{NDVI}_{\min}] / [\text{NDVI}_{\max} - \text{NDVI}_{\min}] \quad (10)$$

where  $\text{NDVI}_n$  is the normalized NDVI,  $\text{NDVI}$  is the daily value,  $\text{NDVI}_{\min}$  and  $\text{NDVI}_{\max}$ , are the minimum and maximum NDVI values, respectively. For the 1993–1994 and 1995–1996 seasons,  $\text{NDVI}_{\min}$  was 0.191 and 0.155, respectively, and  $\text{NDVI}_{\max}$  was 0.927 and 0.927, respectively.

For each replicate in 1993–1994 and 1995–1996, the average  $\text{NDVI}_n$  was determined for each of the 2- to 11-day measurement intervals during the season. The average  $\text{NDVI}_n$  values were then paired with the derived  $K_{cb}$  values for the corresponding replicate and measurement interval. The time-reference for the paired  $\text{NDVI}_n - K_{cb}$  data was taken as the mid-day of the particular measurement interval. Regression procedures were used to model the  $\text{NDVI}_n - K_{cb}$  relationship using data for all replicates in 1993–1994 and 1995–1996.

### Evaluation data

The  $\text{NDVI}_n - K_{cb}$  regression model was tested with data obtained for the 1996–1997 season. As for 1993–1994 and 1995–1996, measured NDVI values for each of the four replicates in 1996–1997 were first interpolated linearly, generating separate daily NDVI values for each of the four replicates. The daily NDVI data for each replicate were then normalized by Eq. 10 using a minimum NDVI value for 1996–1997 (0.185), determined as the average NDVI at emergence for the four replicates. Since the actual maximum wheat NDVI value will not be known until rather late in the wheat season, an assumed  $\text{NDVI}_{\max}$  value will need to be established ahead of time in order to apply real-time estimation for  $K_{cb}$ . Thus, for the purpose of testing the model with the 1996–1997 data, we ignored the fact that we already knew what the actual  $\text{NDVI}_{\max}$  for 1996–1997 was (0.922) and presupposed that  $\text{NDVI}_{\max}$  would be 0.927 (i.e., the average  $\text{NDVI}_{\max}$  as obtained for the 1993–1994 and 1995–1996 seasons). Daily  $K_{cb}$  values were calculated with the regression model function for each replicate of the 1996–1997 experiment using daily  $\text{NDVI}_n$  values obtained from the normalization of the daily NDVI. Evaluation consisted of comparing the differences between the  $\text{ET}_c$  estimated with the FAO-56

dual procedures using the daily  $K_{cb}$  values and the measured  $\text{ET}_c$  as determined for 27 measurement intervals during the season. Statistical evaluations included the coefficient of determination ( $r^2$ ), root mean square error (RSME), mean absolute error [MAE] (Legate and McCabe 1999), and the mean absolute percent difference [MAPD] (Kustas et al. 1999).

## Results and discussion

### Measured evapotranspiration

Measured mean seasonal  $\text{ET}_c$  determined from the soil water balance for the C–H plots decreased slightly from the first to the last wheat seasons, as did the calculated seasonal  $\text{ET}_o$  (Table 1). For a large majority of the irrigations and for significant rainfall events that were larger than 10 mm during the seasons, deep percolation could not be detected from increased soil water below the estimated root zone following wetting. Thus, for those measurement intervals when DP was not detected, as well as for the intervals when water was not added to plots, potential errors for measured  $\text{ET}_c$  due to imprecise DP estimates would be expected to be small, e.g., 5% or less. However, soil water measurements revealed increased moisture below the root zone for several wetting events during each season, which occurred generally towards the latter part of the season when irrigation applications were increased. For these events, the calculated quantities for DP varied from 1 to 22 mm for plot replicates during the three seasons. Thus, for those measurement intervals the uncertainty for DP would generally have a greater impact on the measured  $\text{ET}_c$  values. For example, assuming that the largest DP (22 mm) that was determined was accurate to only  $\pm 50\%$ , the measured  $\text{ET}_c$  for the corresponding interval would be associated with an error on the order of 28%. However, such extreme imprecision for DP was more likely the exception than the rule. When considering all measurement intervals for each season, the mean error for measured  $\text{ET}_c$  due to DP uncertainty would be expected to approach the ratio of seasonal DP to the seasonal measured  $\text{ET}_c$  for the three seasons (Table 1), or approximately 7–10%. For a majority of intervals, the potential error for  $\text{ET}_c$  would be smaller than the mean error, whereas errors larger than the mean could

**Table 1** Mean  $\pm$  standard deviation for measured seasonal irrigation and rainfall, deep percolation, seasonal evapotranspiration ( $\text{ET}_c$ ), estimated basal and soil evaporation quantities of  $\text{ET}_c$  from

back-calculation procedures, and seasonal reference evapotranspiration ( $\text{ET}_o$ ) for the C–H plot replicates in the 1993–1994, 1995–1996, and 1996–1997 wheat experiments

Wheat season	Irrigation and rain (mm)	Deep percolation (mm)	<sup>a</sup> Seasonal $\text{ET}_c$ (mm)	Basal $\text{ET}_c$ (mm)	Soil evaporation (mm)	Seasonal $\text{ET}_o$ (mm)
1993–1994	710 $\pm$ 11	47 $\pm$ 13	624 $\pm$ 16	581 $\pm$ 18	43 $\pm$ 2	651
1995–1996	692 $\pm$ 5	59 $\pm$ 5	599 $\pm$ 12	569 $\pm$ 14	30 $\pm$ 4	639
1996–1997	656 $\pm$ 10	42 $\pm$ 14	591 $\pm$ 25	547 $\pm$ 23	44 $\pm$ 3	616

<sup>a</sup> Measured  $\text{ET}_c$  began with the first soil water measurement after the date of crop emergence in all seasons



be associated with a few intervals during the season when wetting occurred.

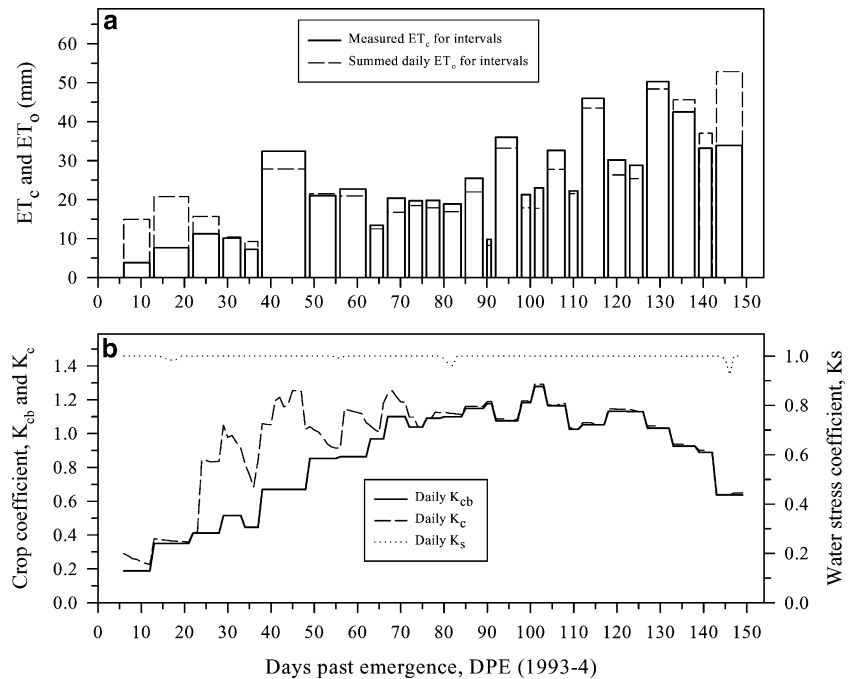
### Derived $K_{cb}$ estimates

Resulting derivations of  $K_{cb}$  values are shown for one of the C–H replicates in the 1993–1994 season in Fig. 3. The measured  $ET_c$  values for intervals during the first 37 days past emergence (DPE) and during late season (133–149 DPE) were smaller than the summation of the daily  $ET_o$  for those intervals (Fig. 3a). For intervals that occurred from 38 to 132 DPE, measured  $ET_c$  was generally greater than the summation for daily  $ET_o$ . Back-calculation results indicated that the measured  $ET_c$  included considerable soil evaporation following irrigation and rainfall during early season growth prior to 70 DPE when  $\approx 90\%$  canopy cover was attained. The difference between the  $K_c$  and  $K_{cb}$  value for a given day (Fig. 3b) describes the magnitude for  $K_e$ , and thus the magnitude of the contribution of soil evaporation for the measured  $ET_c$ . Back-calculations procedures for the C–H replicate resulted in  $K_{cb}$  trends consistent with seasonal canopy development patterns, where initially small  $K_{cb}$  values increased gradually during early growth to a  $K_{cb}$  near 1.0 at 90% cover (70 DPE). The derived  $K_{cb}$  values then varied from 1.0 to 1.3 for periods through 132 DPE, and then gradually decreased after 132 DPE during canopy senescence.

As with DP uncertainty for measured  $ET_c$ , the accuracy of the various parameter estimates used to describe  $K_e$  and  $K_s$  in the FAO-56 back-calculations have a degree of uncertainty and, therefore, affect the exactness of the derived  $K_{cb}$  values. The seasonal soil evaporation that was estimated (Table 1) represented

about 5–7% of the measured seasonal  $ET_c$  for the three wheat seasons, which are reasonable values when considering less energy would be available for evaporation for buried emitters as opposed to when water is applied at the soil surface. The values for the derived  $K_{cb}$  would be most affected by incorrect  $K_e$  estimates during the early season, whereas once full cover is obtained the  $K_e$  and  $K_{cb}$  values would be suspect only if  $K_e$  was greater than  $K_{cb}$  by considerably more than 0.05, even following rain events, which was not the case for any of the analyses made. Since the values chosen for the surface soil parameters REW and TEW can influence the estimate of  $K_e$ , an analysis was made to examine the effects on the derived  $K_{cb}$  values when different values for REW and TEW are assumed instead of those used in the back-calculations, i.e., 10 and 25 mm, respectively. The analysis was performed for the 1993–1994 replicate, whose derived crop coefficients were previously shown in Fig. 3. The FAO-56 tabulated (FAO-56, Table 19) values for the extreme lower and upper limits of the parameters for the soil type were considered, where for the lower limit the REW and TEW were 8 and 22 mm, respectively, and for the upper limit they were 12 and 29 mm, respectively. The results of the analysis indicate that the derived  $K_{cb}$  for the replicate would change by about  $\pm 5.0\%$  during the first 65 DPE, if either the lower or upper parameter extremes had been used, but there would be little or no difference for derived  $K_{cb}$  due to soil parameter values afterwards. However, it was less likely that errors associated with  $K_s$  estimation (e.g., an inaccurate rooting depth) had much of an impact on the derived  $K_{cb}$ . For all replicates,  $K_s$  was calculated to be slightly less than 1.0 for only a few days during each of the three seasons. If for those few instances, the actual

**Fig. 3** Seasonal patterns of measured evapotranspiration ( $ET_c$ ) determined for 27 intervals for a C–H replicate during the 1993–1994 wheat season and the summation of daily reference evapotranspiration ( $ET_o$ ) for each interval (a) and the basal crop coefficient ( $K_{cb}$ ) values derived for each interval, daily estimates of the single crop coefficient ( $K_c$ ) and water stress coefficient ( $K_s$ ) as obtained from the  $ET_c$  measurements using back-calculations of the FAO-56 dual crop coefficient procedures (b)



$K_s$  should have been 1.0 instead of the lower values, the change for the derived  $K_{cb}$  during those periods would have been less than 1.0% for all cases. More severe effects of water stress than those calculated were also unlikely due to the frequent sub-surface irrigation schedule used for the C-H replicates for all three wheat seasons.

The derived  $K_{cb}$  and  $NDVI_n$  values are plotted vs days past emergence for all replicates of the 1993–1994 and 1995–1996 seasons in Fig. 4a, b, respectively. For both years, derived  $K_{cb}$  and  $NDVI_n$  increased from crop emergence until maximum values for the parameters were attained about 70 DPE. Afterwards, the  $NDVI_n$  fluctuated between 0.97 and 1.0 until about 110 DPE for both seasons, and thereafter began to decrease rather sharply through the end of the growing season. The maximum value for  $K_{cb}$  was slightly greater than 1.3 during both years. The trends for  $K_{cb}$  for both years were similar to those for  $NDVI_n$ , although the  $K_{cb}$  values varied more than for  $NDVI_n$  among the four replicates during the seasons. This observation of greater variation for  $K_{cb}$  than  $NDVI_n$  could imply inexactness for the derived  $K_{cb}$  values, as previously discussed. On

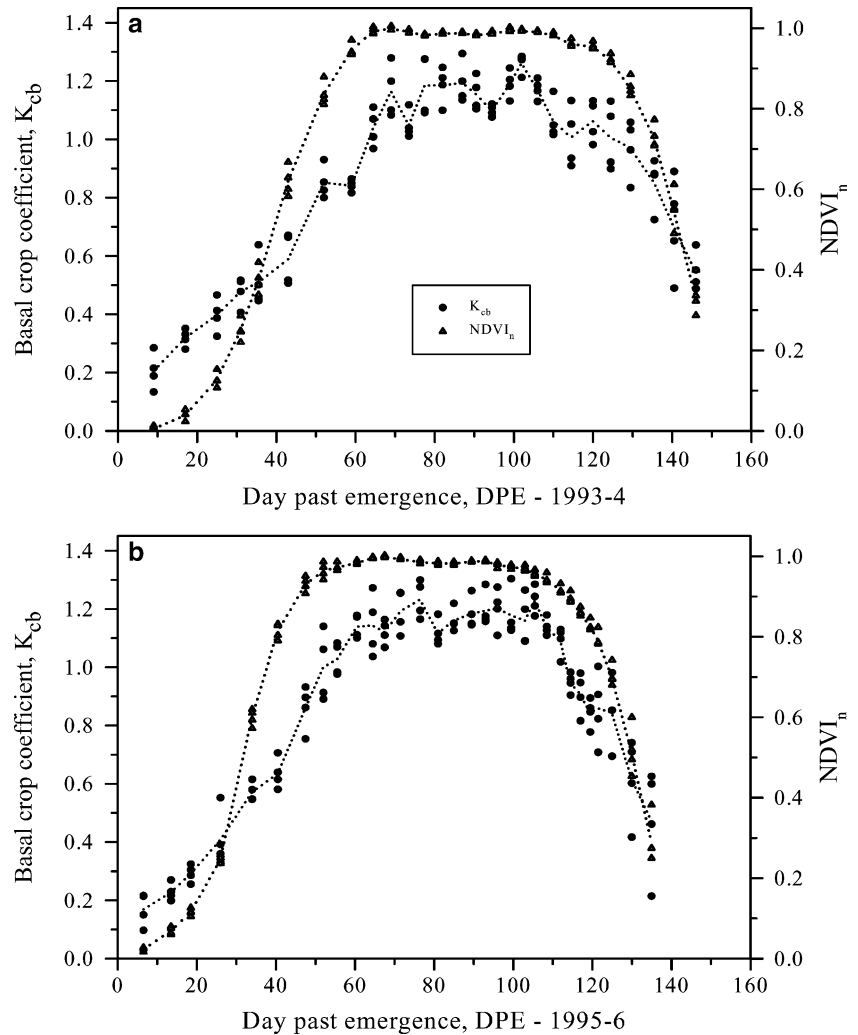
the other hand, there could have been unobserved plant adaptation effects occurring below ground (e.g., soil or nutrient variability) that may have caused differences in crop water uptake among replicates, and therefore actual differences for  $K_{cb}$  that could not be detected from the above-ground reflectance properties of the canopy.

A third-order polynomial regression model was fitted to the combined data from the 1993–1994 and 1995–1996 seasons to describe  $K_{cb}$  as a function of  $NDVI_n$  (Fig. 5 and Table 2). Although a linear regression of the data in Fig. 5 resulted in an  $r^2$  of 0.85 compared to 0.90 for the third-order polynomial, the third-order model was selected over the linear model because it indicated better overall agreement with the data, particularly for the lowest and highest values obtained for  $K_{cb}$  and  $NDVI_n$ .

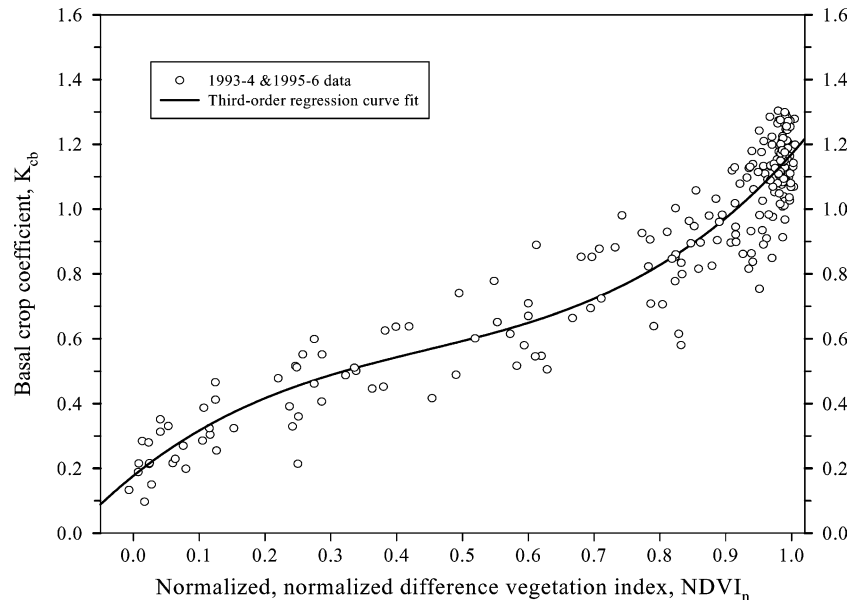
Model-estimated versus derived  $K_{cb}$  and measured  $ET_c$  for 1996–1997

The  $K_{cb}$  estimated with the  $NDVI_n$  model given in Table 2 for each of the four replicates of 1996–1997 are

**Fig. 4** Derived  $K_{cb}$  values and normalized, normalized difference vegetation index ( $NDVI_n$ ) values for all four replicates with days past emergence (DPE) for the measurement intervals of the 1993–1994 (a) and the 1995–1996 wheat seasons (b)



**Fig. 5** Derived  $K_{cb}$  values shown as a function of the normalized, normalized-difference vegetation index ( $NDVI_n$ ) for combined data of the 1993–1994 and 1995–1996 wheat seasons, and the resultant third order regression model fitted to the data



**Table 2** Regression coefficients and statistics for wheat  $K_{cb}$  as a function of the normalized, normalized difference vegetation index ( $NDVI_n$ ) for data from the 1993–1994 and 1995–1996 wheat experiments

Regression coefficients <sup>a</sup>				Regression statistics <sup>b</sup>		
a0	a1	a2	a3	$r^2$	se ( $K_{cb}$ )	$n$
0.18	1.63	-2.57	1.93	0.90	0.10	232

<sup>a</sup> Regression coefficients are for the third-order polynomial,  $K_{cb} = a_0 + a_1X + a_2X^2 + a_3X^3$ , where  $X$  is  $NDVI_n$ .

<sup>b</sup>  $r^2$  is the coefficient of determination, se ( $K_{cb}$ ) is the standard error of the  $K_{cb}$  estimates, and  $n$  is the number of data points used in the regression

compared to the derived  $K_{cb}$  for the 27 soil water measurement intervals made during the season (Fig. 6). For measurement intervals between 10 and 40 days past emergence, the estimated  $K_{cb}$  were generally consistent with the derived  $K_{cb}$  for all replicates, whereas between 40 and 80 DPE the estimated  $K_{cb}$  tended to be somewhat higher than the derived  $K_{cb}$ . However, the estimated  $K_{cb}$  were consistently lower than the derived  $K_{cb}$  for measurement intervals after 80 DPE for all replicates except replicate four, which had estimated  $K_{cb}$  values that fluctuated slightly above and below the derived  $K_{cb}$  for measurement intervals after 80 DPE (Fig. 6d).

Estimated and measured  $ET_c$  are shown as daily averages for each of the 27 measurement intervals in Fig. 7. These  $ET_c$  values had trends similar to those between estimated and derived  $K_{cb}$  during the season, where  $ET_c$  agreement was reasonably good during the first 40 days past emergence, but measured  $ET_c$  was generally overestimated for the replicates from 40 to 80 DPE. For replicates one, two, and three, lower than derived  $K_{cb}$  estimates after 80 DPE resulted in estimated  $ET_c$  that was typically lower than measured  $ET_c$  after 80 DPE for those replicates (Fig. 7a–c). Nevertheless, when

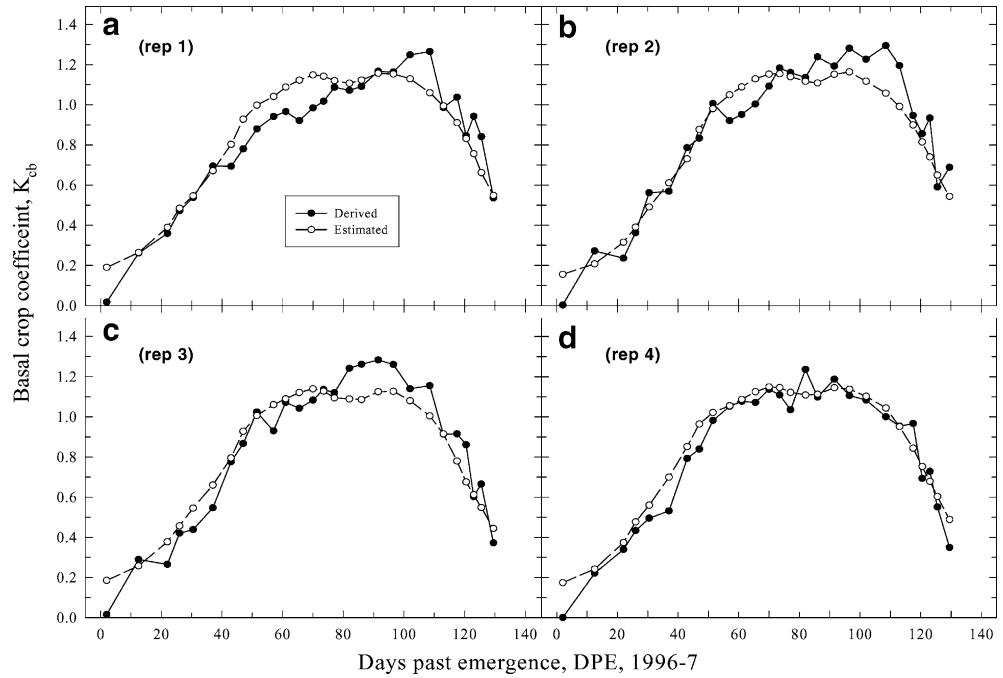
the measured and estimated  $ET_c$  data were applied in linear regression, high  $r^2$  values were obtained for all replicates (Table 3), indicating that the  $NDVI_n$ -based estimates for  $ET_c$  matched the measured  $ET_c$  rather well during the season (Fig. 8). Also, the particular trends for the differences noted between estimated and measured  $ET_c$  tended to offset when considering the total seasonal  $ET_c$  estimates, which were in good agreement with the measured total  $ET_c$  (Table 3). The differences between the estimated and measured total seasonal  $ET_c$  varied among replicates from -5% (-33 mm) to 3% (18 mm).

Statistics for the estimated and measured  $ET_c$  (i.e., the data presented in Fig. 7) calculated separately for each of the four replicates (Table 3) show that the mean and standard deviations (SD) for the estimated  $ET_c$  were near those for the measured  $ET_c$  for all replicates. The root mean square error varied from 0.42 to 0.71 mm, whereas the mean absolute error varied from 0.31 to 0.49 mm. The mean absolute percent difference was 10% or less among the replicates, which was similar to the 10% variation in  $K_{cb}$  that was unexplained by  $NDVI$  in the model (Table 2). The statistical evaluations suggest that the remotely-sensed  $NDVI$  observations provided reliable  $K_{cb}$  estimates for determining the wheat  $ET_c$  for all replicates during the 1996–1997 season.

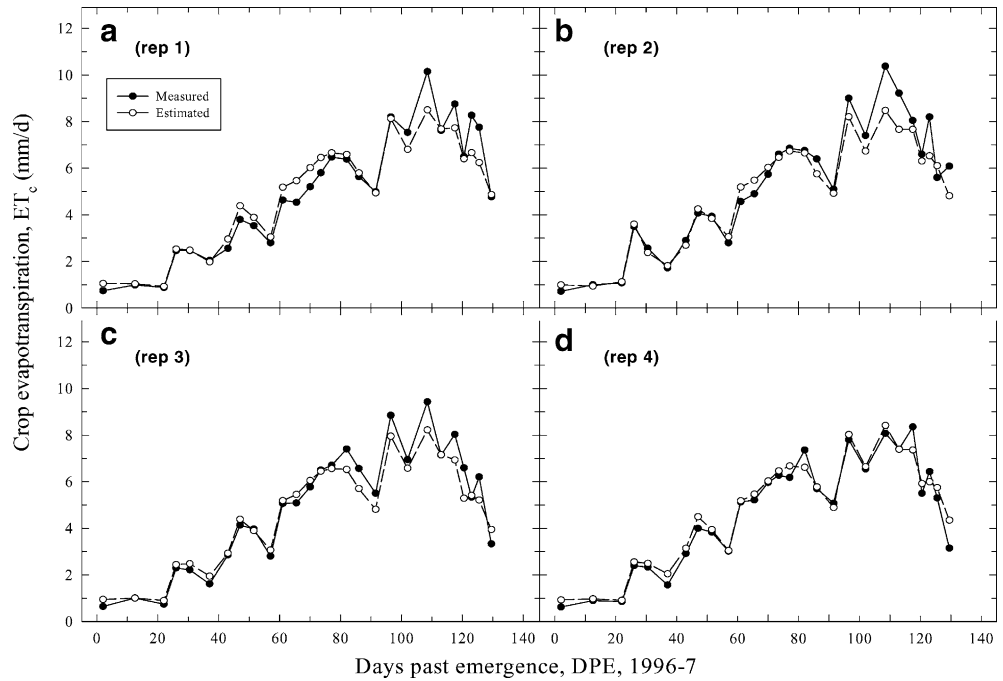
## Conclusions

A regression relationship was developed to model wheat  $K_{cb}$  values from a normalized  $NDVI$ . An initial evaluation of the model suggests that remotely-sensed  $NDVI$  observations offer a practical approach for determining real-time  $K_{cb}$  and crop evapotranspiration patterns during the wheat season. Because the  $NDVI$ -modeled  $K_{cb}$  values can be easily incorporated within the FAO-56 dual crop coefficient procedures, as well as other crop

**Fig. 6** Derived  $K_{cb}$  values obtained for 27 measurement intervals using back-calculations of the FAO-56 dual crop coefficient procedures compared to the estimated  $K_{cb}$  for the intervals calculated from normalized, NDVI values using the regression model (Fig. 5 and Table 2) for replicates one (a), two (b), three (c), and four (d) of the 1996–1997 wheat season



**Fig. 7** Measured daily average wheat  $ET_c$  obtained for 27 measurement intervals compared to the estimated daily average  $ET_c$  for the intervals as determined using the estimated  $K_{cb}$  calculated from the regression model within the FAO-56 dual crop coefficient procedures for replicates one (a), two (b), three (c), and four (d) of the 1996–1997 wheat season



coefficient algorithms, the NDVI approach could potentially be a significant step towards improving present wheat crop coefficient  $ET_c$  estimation. Major advantages for the NDVI-determined  $K_{cb}$  compared to conventional time-based  $K_{cb}$  curves are that forecasts of the time-scale for crop developmental stages and weather conditions for the cropping season are no longer needed. Another promising aspect for using the NDVI-based wheat  $K_{cb}$  is its ability to provide a direct approach for determining actual  $ET_c$  conditions when crop

growth and water use deviate from optimum conditions. This capability could eliminate the skill, additional field observations, assumptions, and cumbersome procedures required for adjusting generalized  $K_{cb}$  curves to reflect sub-optimum conditions. The remote sensing  $K_{cb}$  technique may also potentially provide the ability to detect and quantify spatial differences in  $ET_c$  within a single field and on a field-by-field basis, information that presently is difficult to obtain without intensive labor. Future work will include testing the wheat  $K_{cb}$  model for

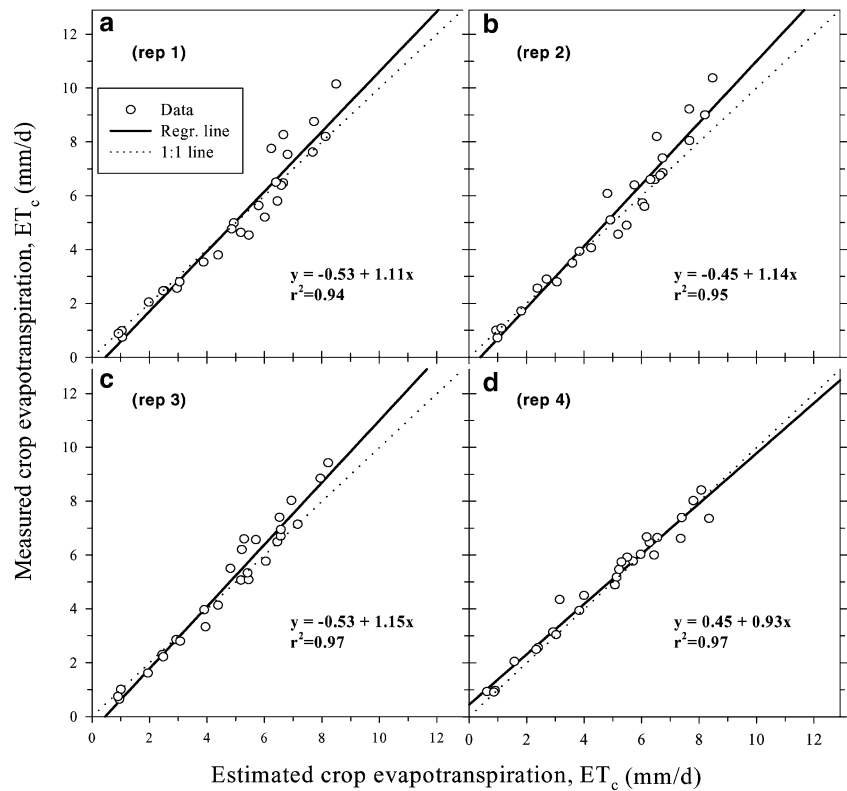


**Table 3** Measured and estimated total seasonal evapotranspiration ( $ET_c$ ) and the mean and standard deviation (SD) for the 27  $ET_c$  determinations made for each replicate of the 1996–1997 wheat experiment

Replicate	Measured $ET_c$			Estimated $ET_c$						
	Season total mm	Mean mm d <sup>-1</sup>	SD	Season total mm	Mean mm d <sup>-1</sup>	SD	RMSE	MAE	MAPD %	$r^2$
1	594	5.0	2.6	593	5.0	2.3	0.68	0.46	9.6	0.94
2	624	5.2	2.6	591	5.0	2.3	0.71	0.49	9.2	0.95
3	582	4.9	2.5	567	4.7	2.1	0.59	0.44	10.4	0.97
4	564	4.7	2.3	582	4.9	2.2	0.42	0.31	9.1	0.97

Statistics for the estimated mean  $ET_c$  are the root means square error (RMSE), mean absolute error (MAE), mean absolute percent difference (MAPD), and the coefficient of determination ( $r^2$ )

**Fig. 8** Measured daily average  $ET_c$  vs estimated daily average  $ET_c$  and linear regression relationships fitted to the data for replicates one (a), two (b), three (c), and four (d) of the 1996–1997 wheat season



estimating  $ET_c$  for a wider range of agronomic conditions than those presented in this paper.

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